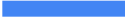


Project Assignment Part 2

System Identification

2022-2023



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Introduction

- This slideshow contains the second part of the System Identification Project.
- The project consists of the creation of a nonlinear polynomial ARX model.
- The degree m and the orders n_a and n_b ($n_a = n_b$) are set by the user, and the delay n_k is equal to 1.
- The model provides both the one-step-ahead prediction and the simulation.
- The source code was written in MATLAB R2021b.

Approaching the problem

- Generating the prediction for identification output (generate ϕ matrix, parameter vector θ , resulting output, compute MSE).
- Generating the prediction for validation output (generate ϕ matrix, resulting output, compute MSE).
- Generating the simulation for identification output (initialize resulting output as empty, then use to generate ϕ matrix and update itself, compute MSE).
- Generating the simulation for validation output (initialize resulting output as empty, then use to generate ϕ matrix and update itself, compute MSE).

Approaching the problem - implementation

- For prediction, phi matrix is generated by calling a function once that generates all of its delayed inputs and outputs and combinations of this terms respectively.
- Identifying the prediction output using linear regression procedure.
- For simulation, phi matrix is generated one row at a time by iteratively calling a function with different parameters, due to the fact that the simulation output is generated based on previous values of the output.

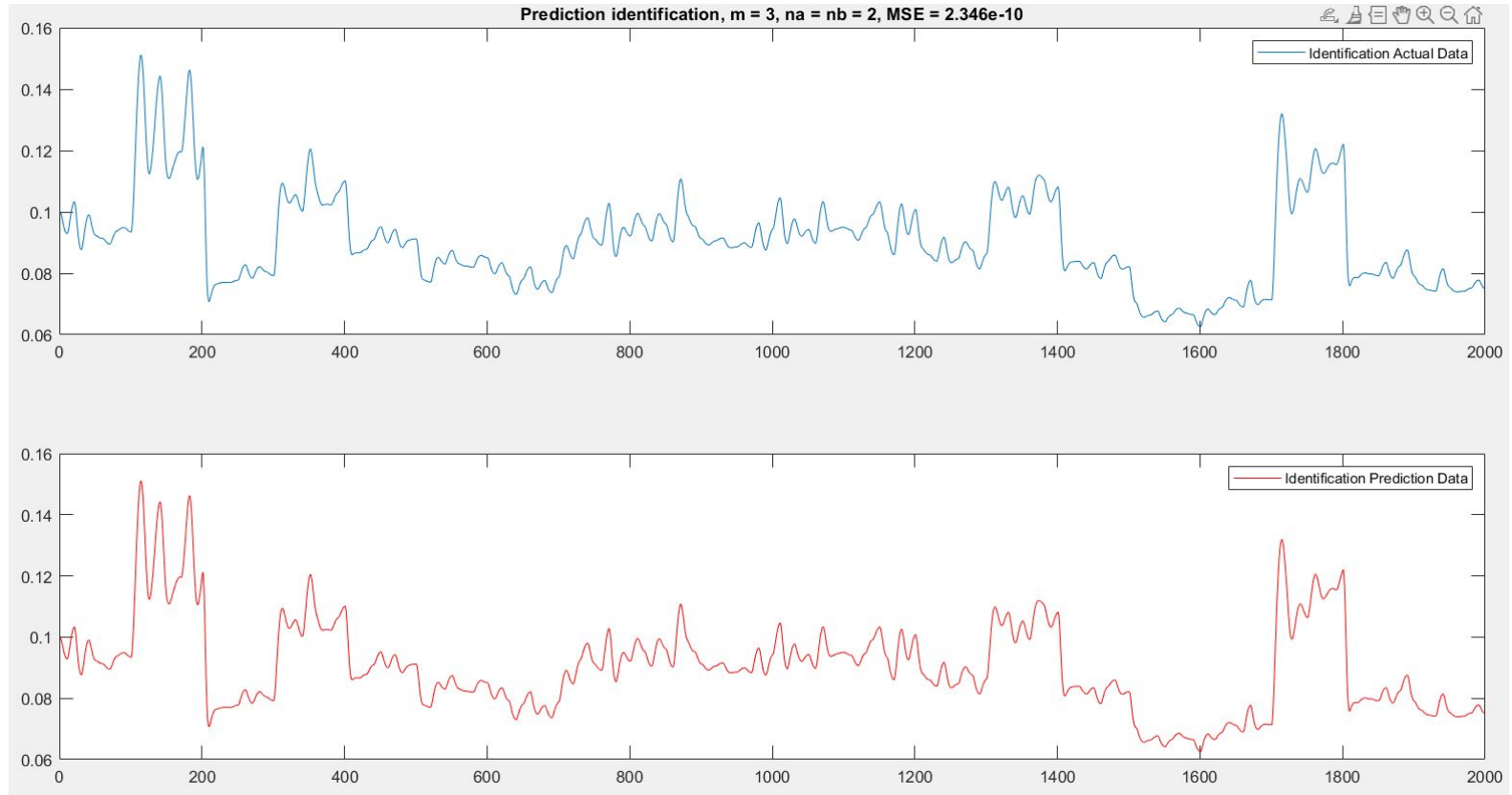
Interpretation of the results

Degree m	Orders na and nb	MSE for prediction for identification data	MSE for prediction for validation data	MSE for simulation for identification data	MSE for simulation for validation data
1	1	6.6338e-06	3.6412e-06	0.39373e-03	0.21011e-03
1	2	5.6052e-06	3.1888e-06	0.56013e-03	0.40355e-03
1	3	5.5831e-06	3.161e-06	0.55309e-03	0.40387e-03
1	4	5.5751e-06	3.1609e-06	0.53031e-03	0.3826e-03
1	5	5.562e-06	3.1557e-06	0.51347e-03	0.36466e-03
2	1	9.0855e-07	7.0993e-07	1.2468e-05	6.4266e-06
2	2	6.425e-09	9.2914e-07	8.3379e-07	NaN

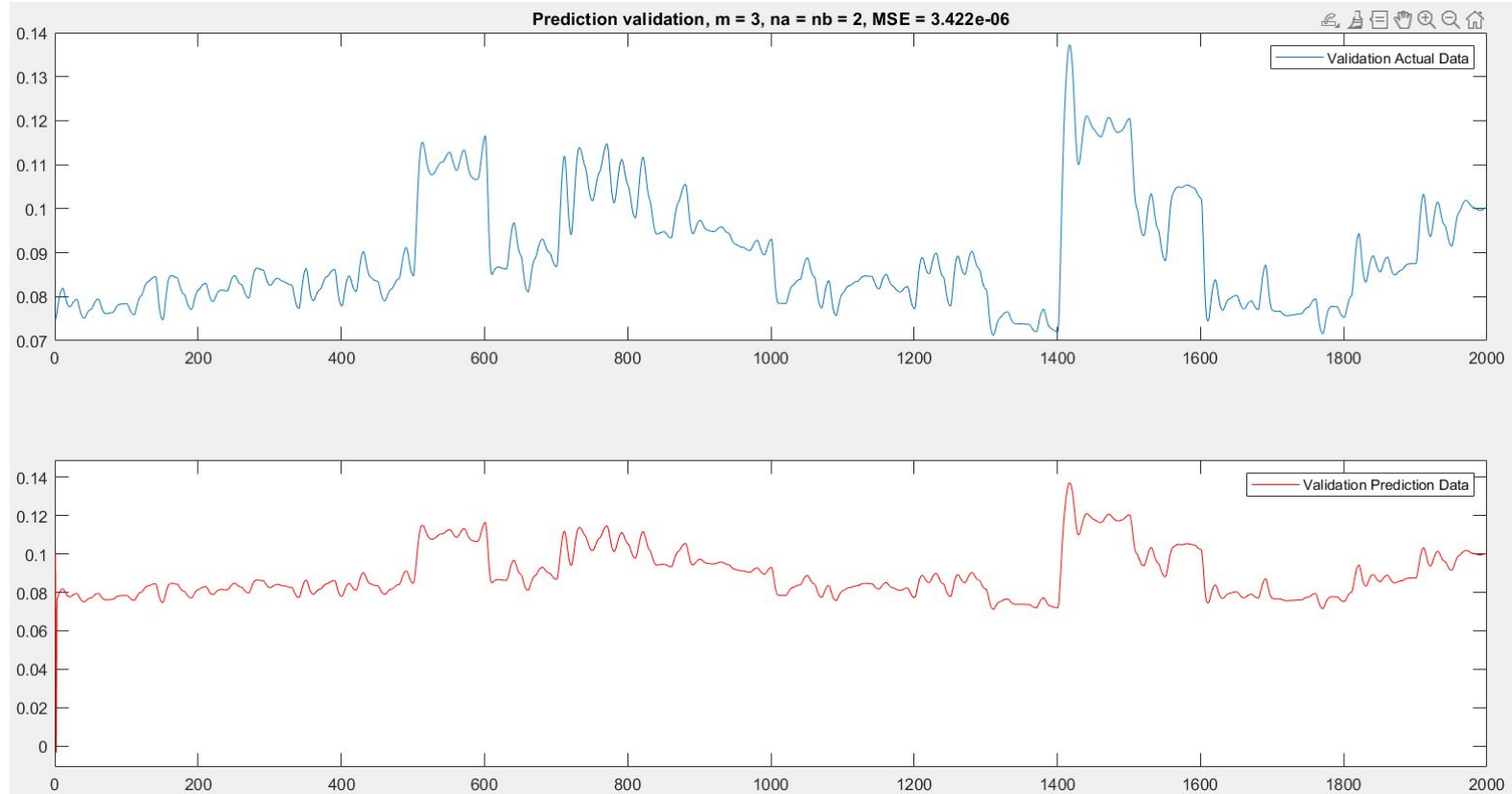
Interpretation of the results

Degree m	Orders na and nb	MSE for prediction for identification data	MSE for prediction for validation data	MSE for simulation for identification data	MSE for simulation for validation data
2	3	6.6653e-10	2.9765e-06	1.3246e-07	NaN
2	4	4.9924e-10	7.8556e-06	3.4038e-07	NaN
2	5	3.8156e-10	3.5925e-05	NaN	NaN
3	1	8.5355e-07	6.9317e-07	1.0686e-05	5.3739e-06
3	2	2.346e-10	3.422e-06	1.2928e-08	5.9045e-07
3	3	1.8269e-10	5.1359e-05	2.3147e-08	NaN
3	4	1.4352e-10	4.4137e-05	1.6565e-08	NaN
3	5	1.2784e-10	2.0667e-05	1.0188e-08	NaN

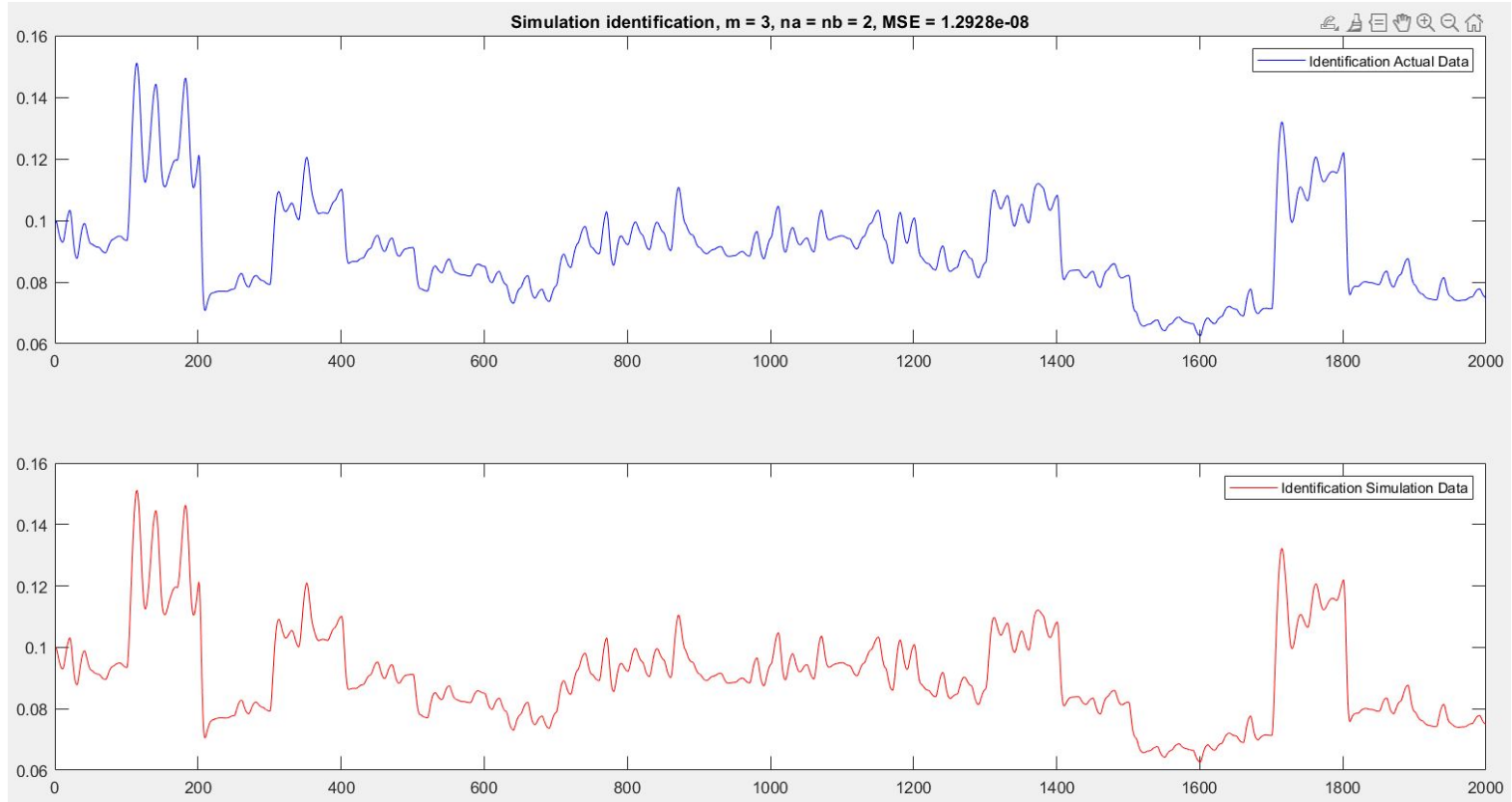
Graphs for best MSEs - prediction for identification data



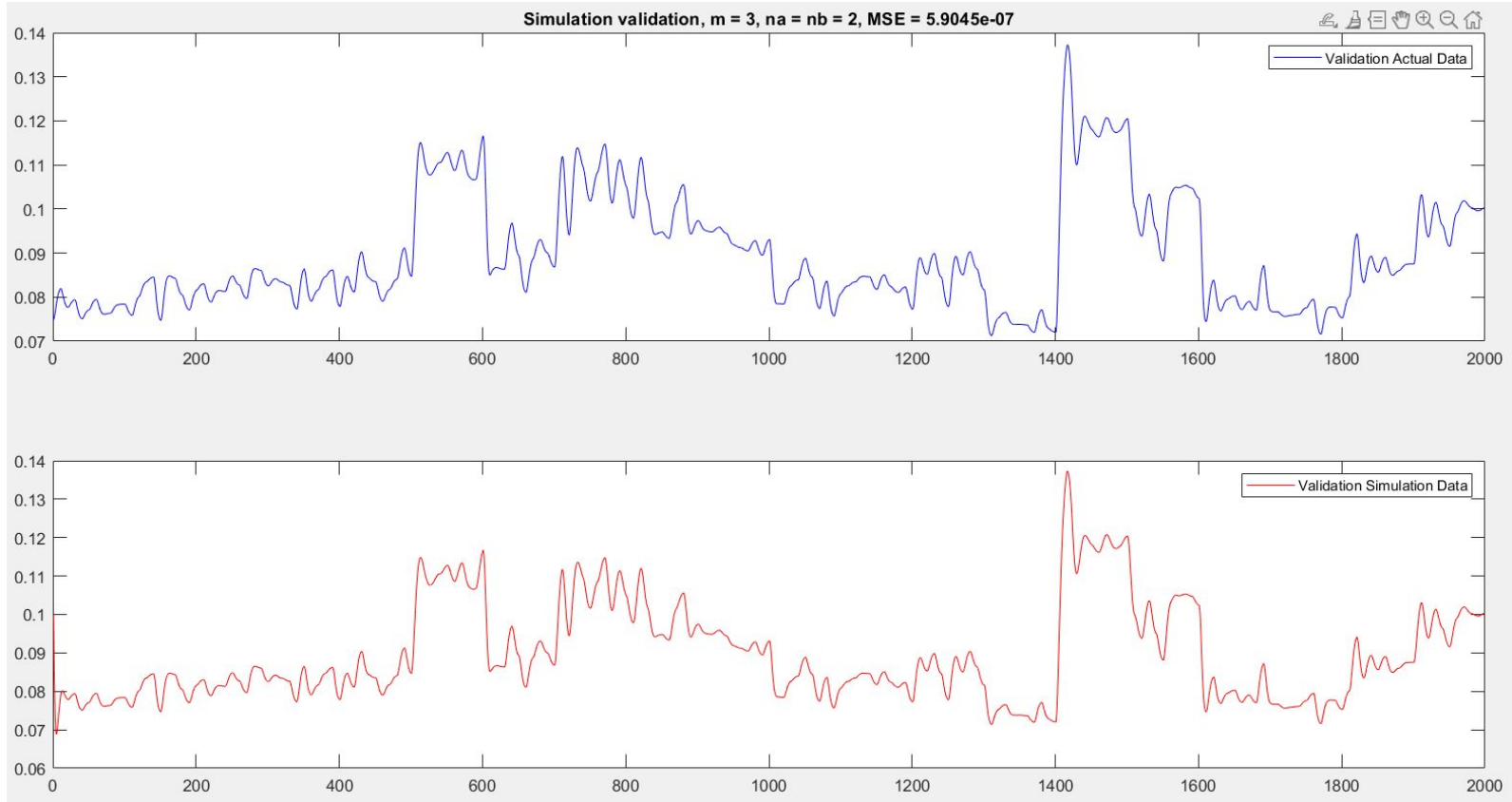
Graphs for best MSEs - prediction for validation data



Graphs for best MSEs - simulation for identification data

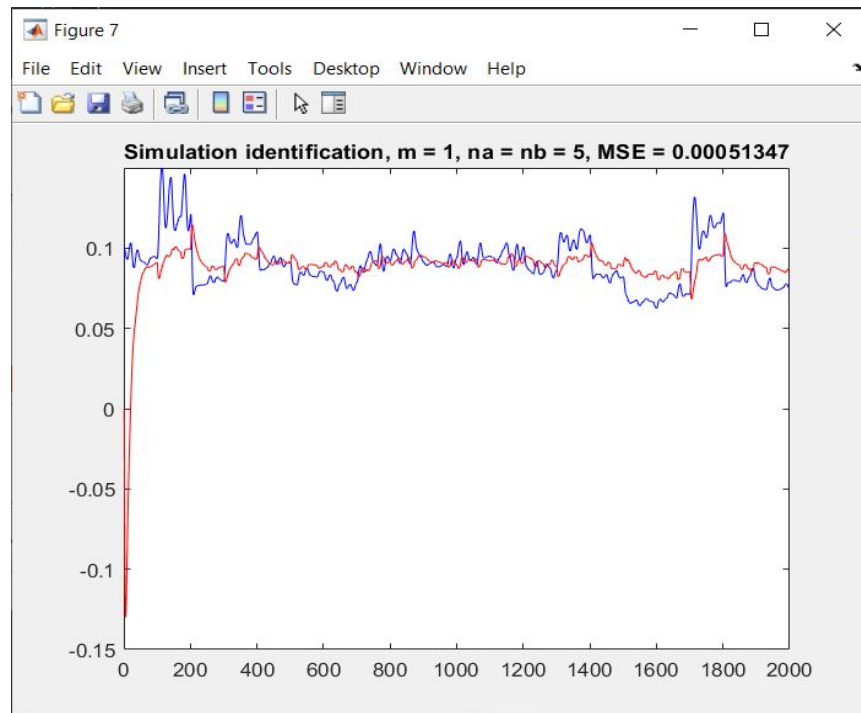
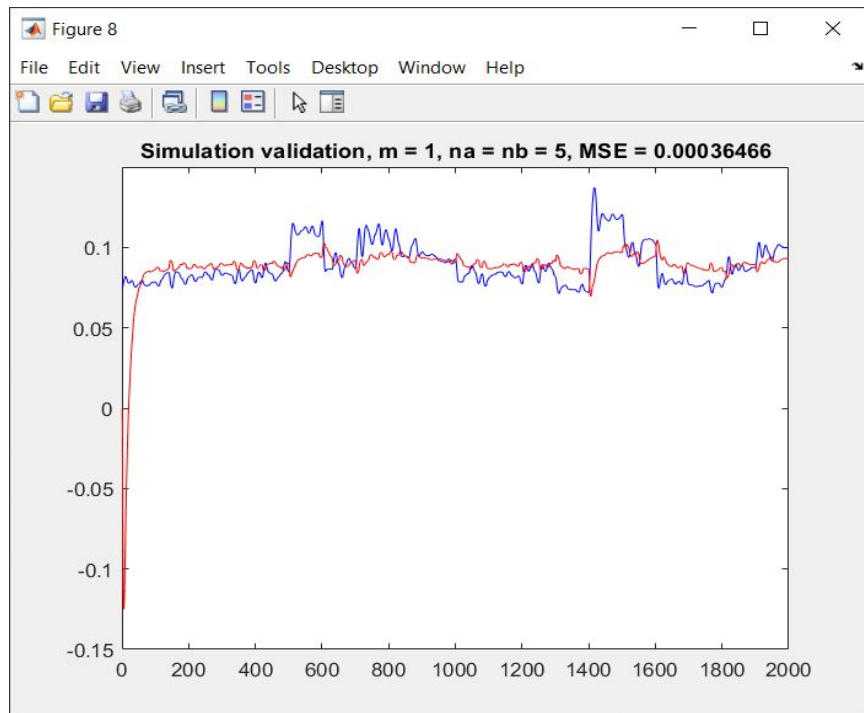


Graphs for best MSEs - simulation for validation data



Underfitted results

- They are obtained for $m=1$, due to the fact that there are not enough input data and the model is unable to capture the relationship between the input and the output variables in an accurate way.



Discussion of the results

- It is observed that the best model (the one with the smallest MSEs) is the one having the degree m equal to 3 and the orders n_a and n_b equal to 2.
- Increasing the values of m and n_a and n_b results in a better model fit with smaller errors.
- For $m=2$ and $m=3$, if $n_a \geq m$ the instability phenomenon occurs in the simulation for the validation data.

Conclusion

- The best results are obtained for m equal to 3 and n_a and n_b equal to 2.
- In conclusion, a nonlinear ARX model can be identified accurately, provided the correct values for the degree and the orders of it are given.
- The obtained ARX model can be used as a black-box model for any dynamic SISO system.